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Help Rather Than Recycle: Alleviating Cold Startup in Serverless Computing Through Inter-Function Container Sharing

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Emerging Parallel
EPCC
Computing Center


Alibaba Cloud



Introduction & Background

- Definition of serverless (FaaS).
- What are advantages and limitations?

Pagurus

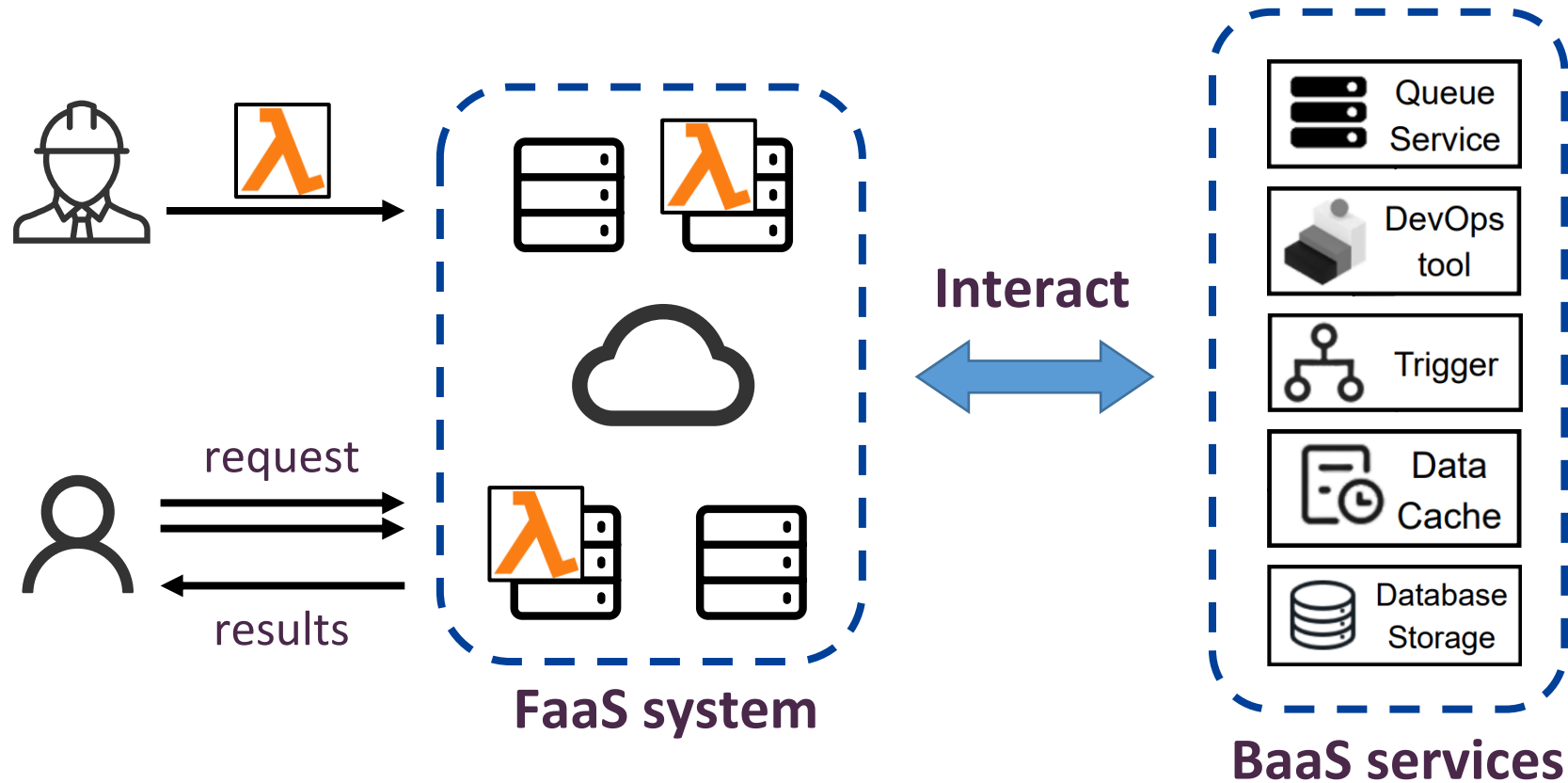


Introduction & Background



What is Serverless?

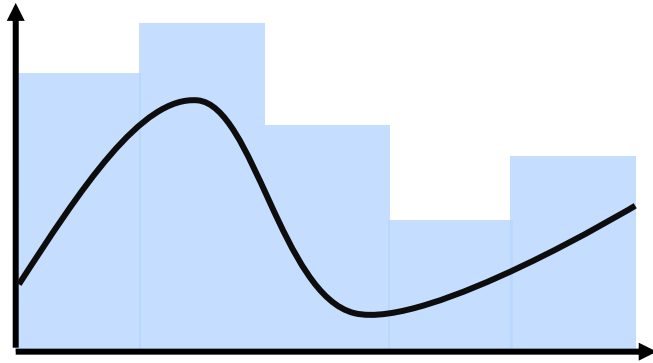
Berkerly's View: "Serverless = FaaS (Function-as-a-Service) + BaaS (Backend-as-a-Service)"



Introduction & Background

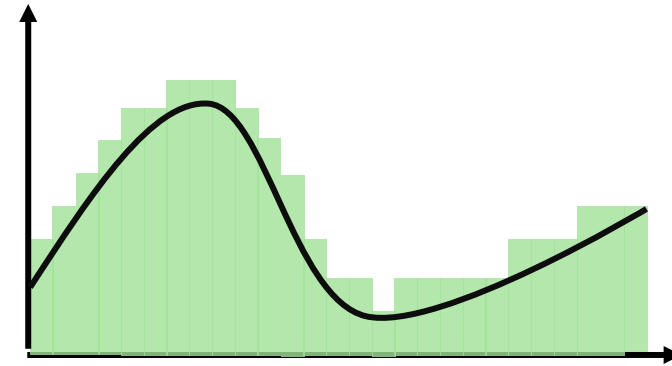


What are the advantages of using serverless model?



Infrastructure-as-a-Service

- Vertical resource scaling with remained
- Maintain the underlying environment
- Pay-as-time, low resource utilization



Function-as-a-Service

- Auto horizontal scaling without remained
- Offloaded environment management
- Pay-as-invocation, high resource utilization

Introduction & Background



The most significant features of serverless computing

Serverless features

- Event-driven



1/ Containers created on-demand



1/ Containers cold startups

- Auto-scaling



2/ Fine-grained resource scaling



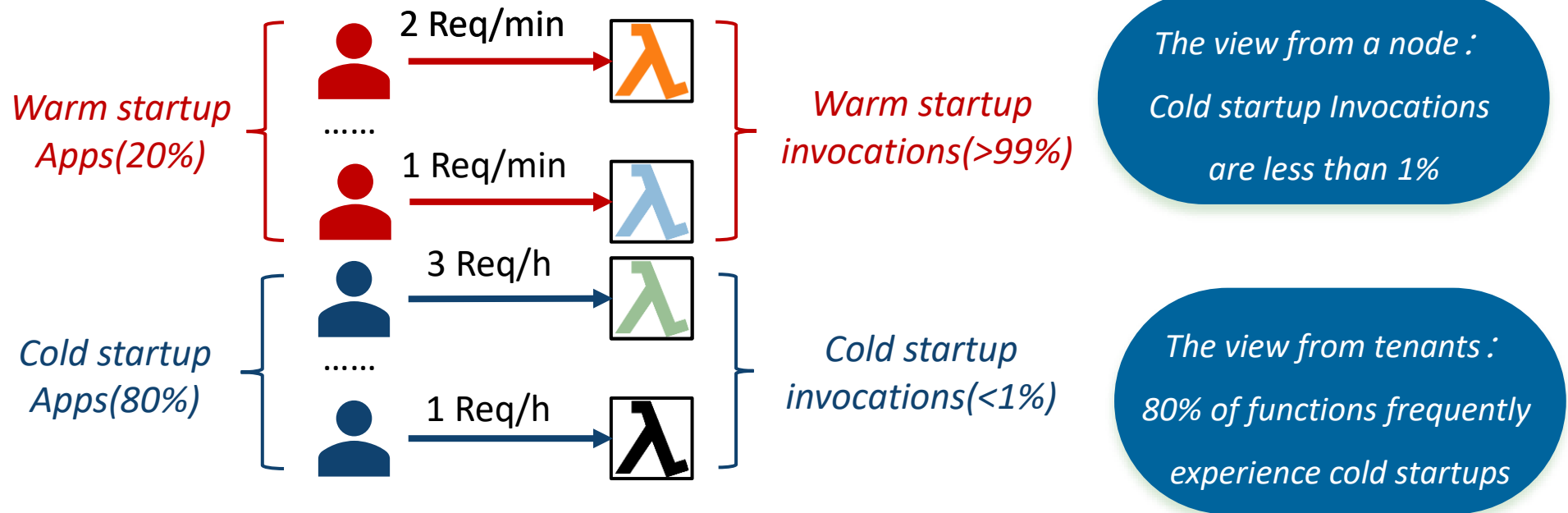
2/ High-density and high-concurrency

- Others (offloaded management, flexible scheduling, pay-as-you-go costing model)

Introduction & Background



Why we should alleviate cold startups?



Functions-invocations follow a Pareto distribution.

- 20% of popular functions occupy 99.6% of overall invocations (observed from Azure trace).

Introduction & Background

Motivation

- How to alleviate cold startups?
- Does the current method work efficiently?

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Motivation



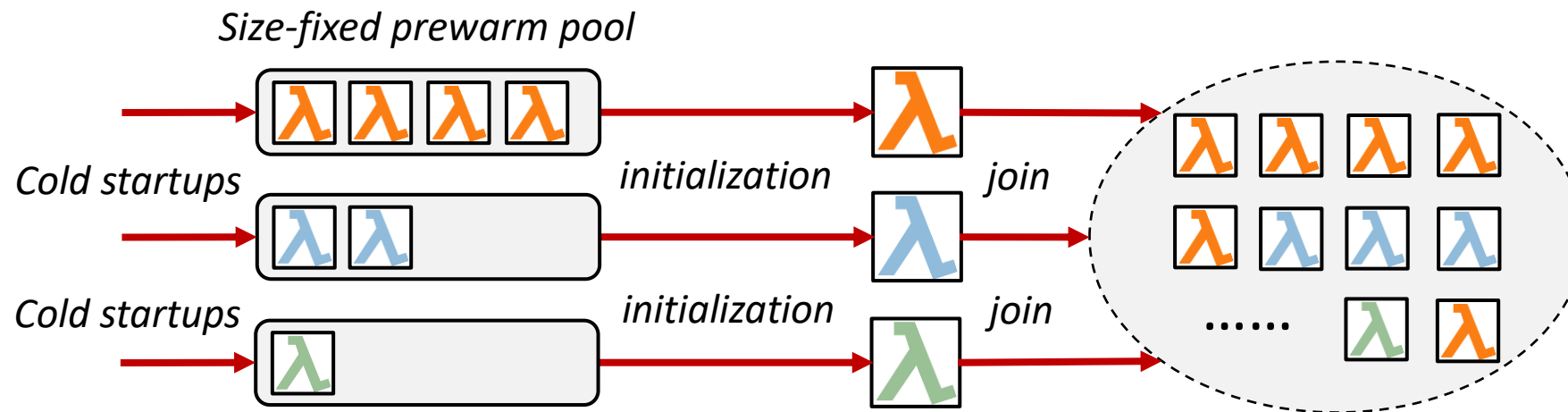
Leveraging prewarmed container to alleviate cold startups:

- Exclusive size-fixed prewarm pool:

good and stable performance, easy to implement

need to adjust the pool size for each function

many long-term running prewarmed and idle containers consume resources



Motivation



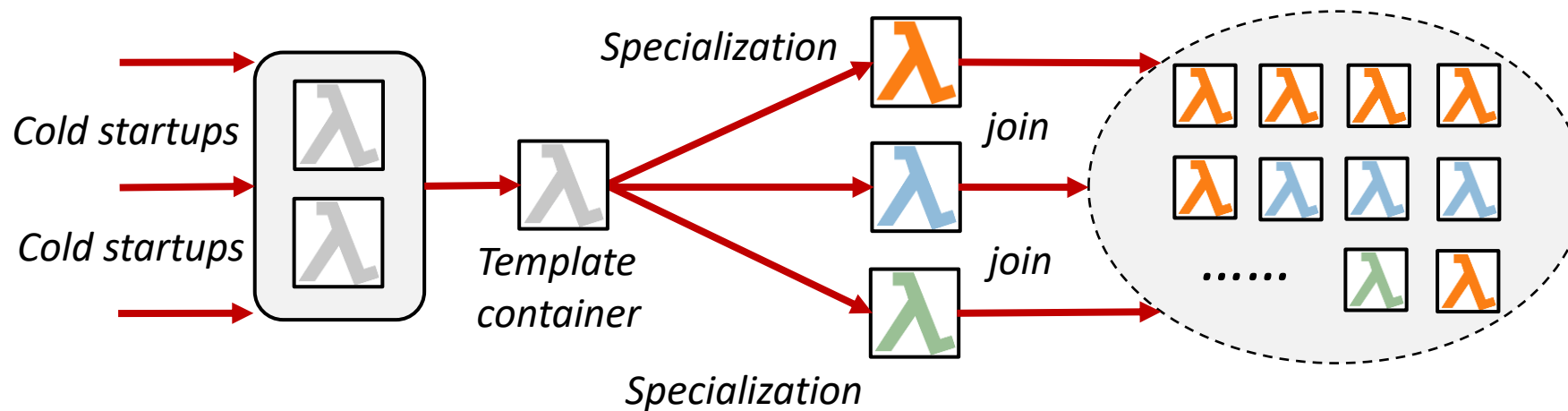
Leveraging prewarmed container to alleviate cold startups :

- Template-based shared prewarm pool:

Resource-friendly

All functions use the same template image, easy to maintain

Specialization phases introduce unpredictable overhead.



Motivation

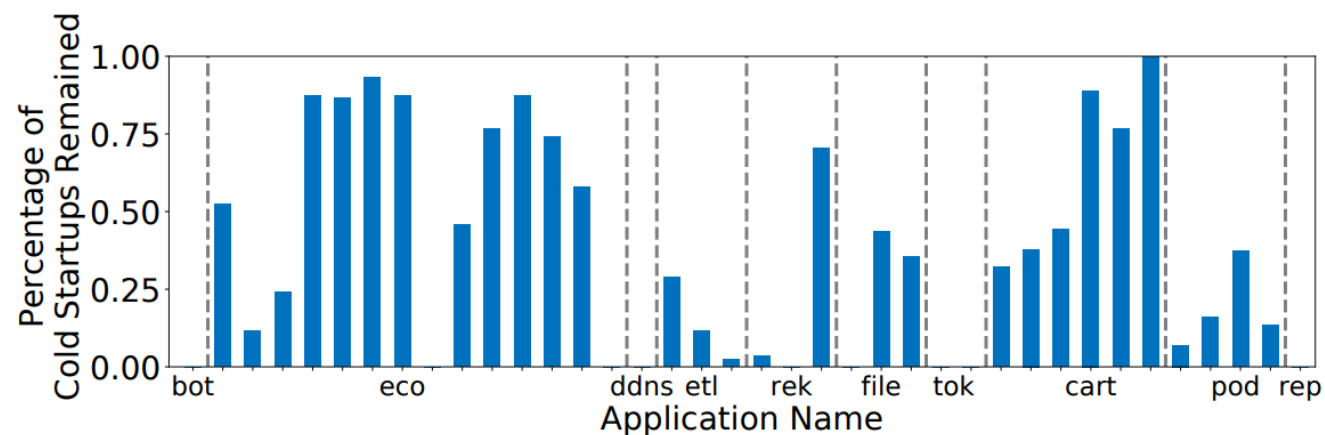


The unpredictable overhead of specialization.

High-concurrency invocation



Prewarm pool breakdown

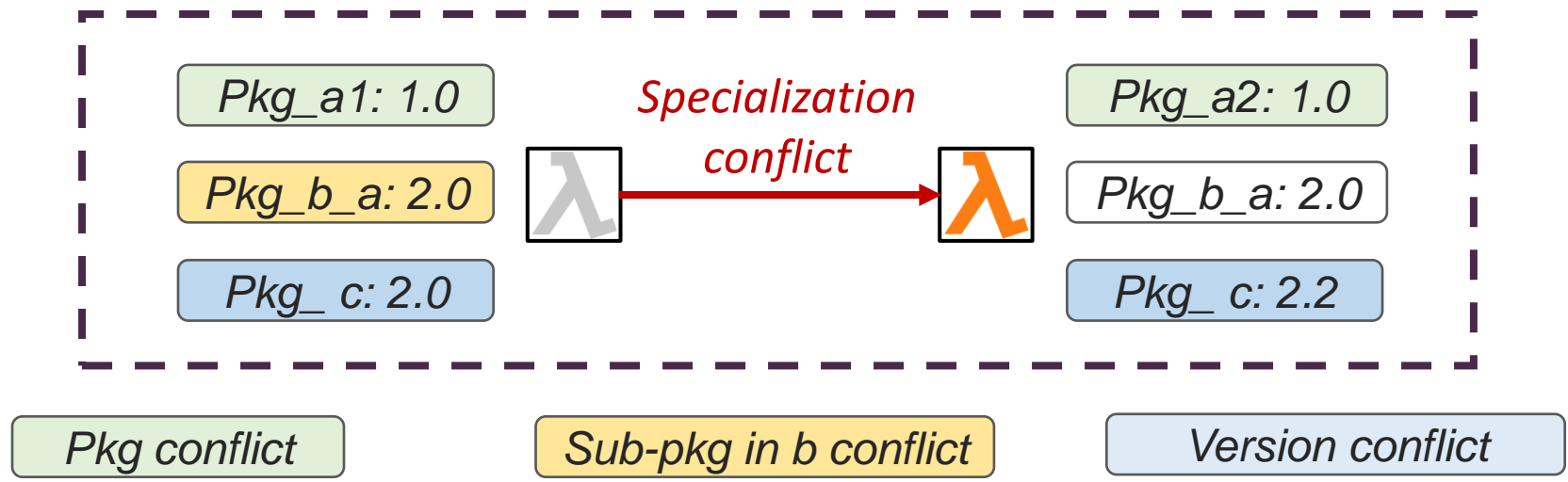


- *five functions are triggered simultaneously by a caller in eco.*
- *Concurrent invocations from these functions contend for the prewarmed containers*

Motivation



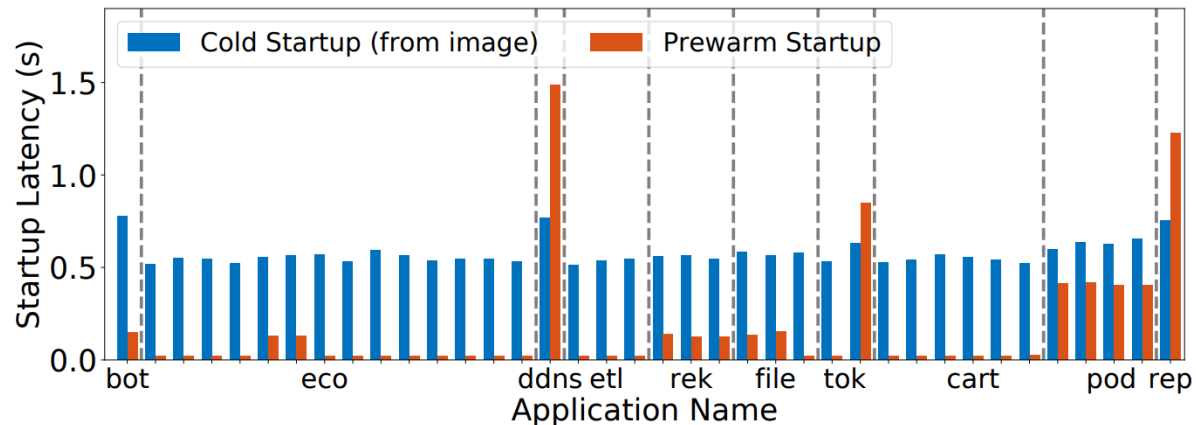
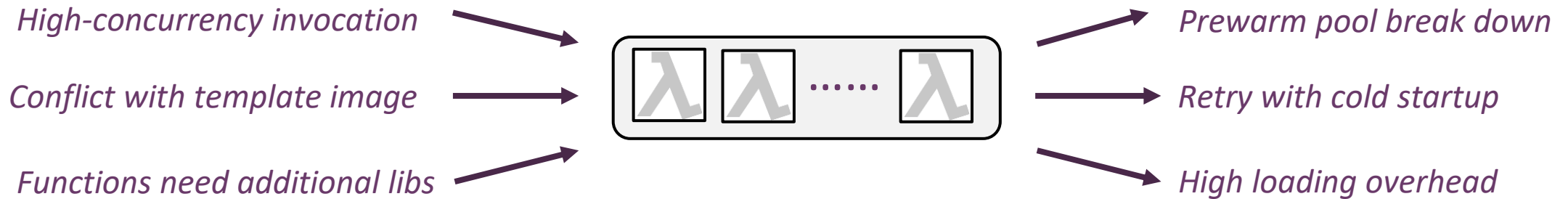
The unpredictable overhead of specialization.



Motivation



The unpredictable overhead of specialization.

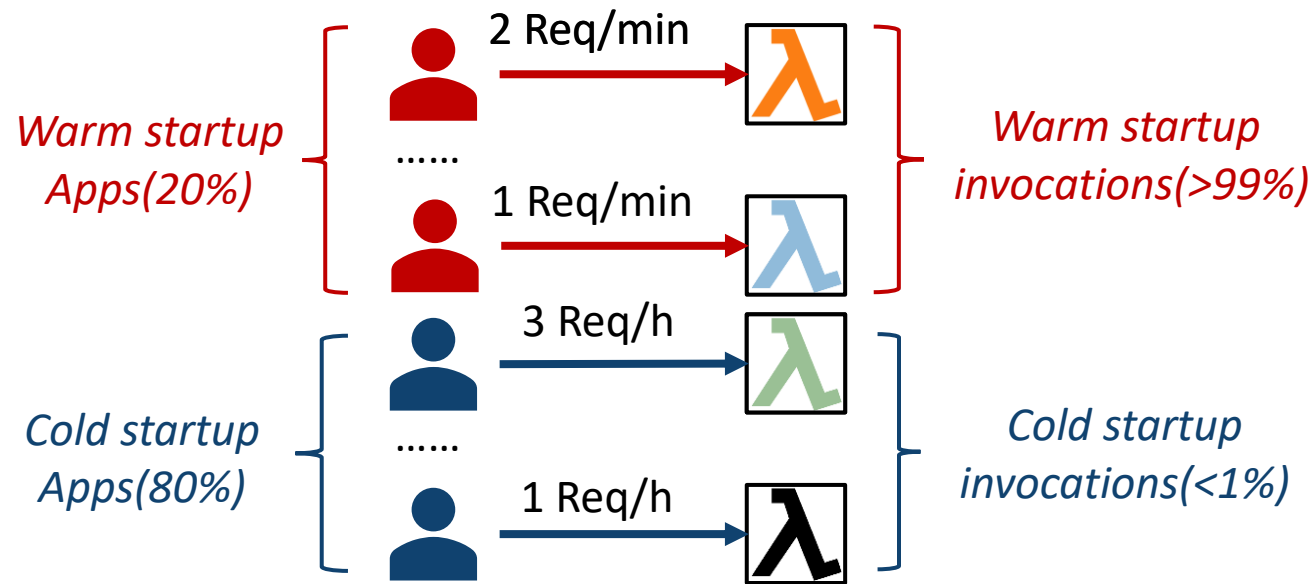


- *ddns* requires to load/install many additional packages in the prewarmed containers
- the package loading is time-consuming, even slower than directly cold startup.

Motivation



Additional trade-offs of template-based prewarm pool.



Build templates for 99% invocations (more cold startups for 80% cold Apps)

Build templates for 80% cold apps (more cold startups for 99% invocations)

Exclusive prewarm vs template-based prewarm:

- *Exclusive prewarm method:*

to save resource, need to adjust pool size dynamically.

profiling and predicting -> need to build model for each function

-> infrequent functions do not have enough trace to train

- *Template-based prewarm:*

three unpredictable overhead of specialization

need to make several trade-offs

***The current prewarm method is not efficient due to several inevitable trade-offs.
It is beneficial to alleviate cold startups without trapping in the same dilemmas.***



Introduction & Background

Motivation

Methodology & Design

- Reusing idle containers
- Build Zygote containers for sharing
- SF-WRS based scheduling policy



Methodology & Design

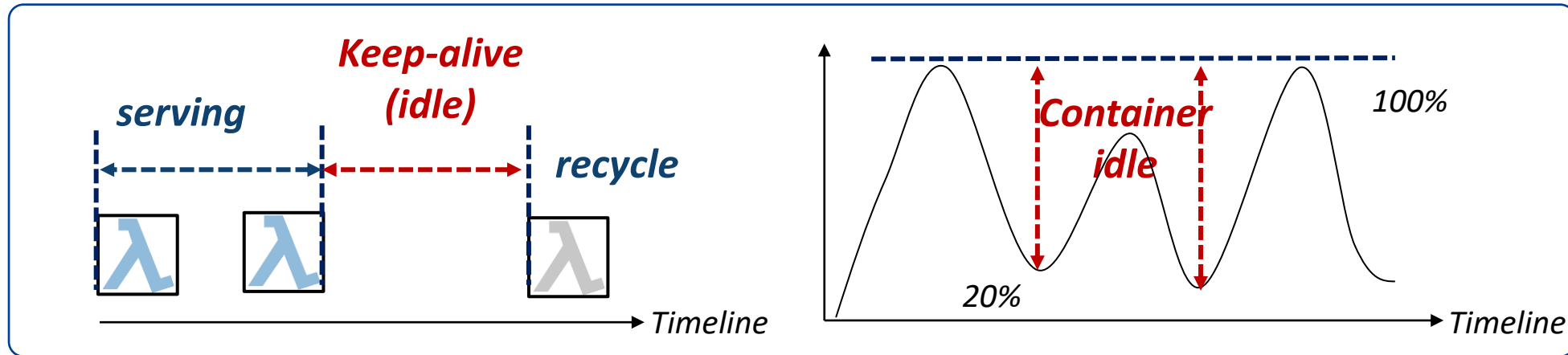


Cold startup alleviation accelerating - Pagurus



Can we reuse idle containers for functions to avoid cold startups like Pagurus?

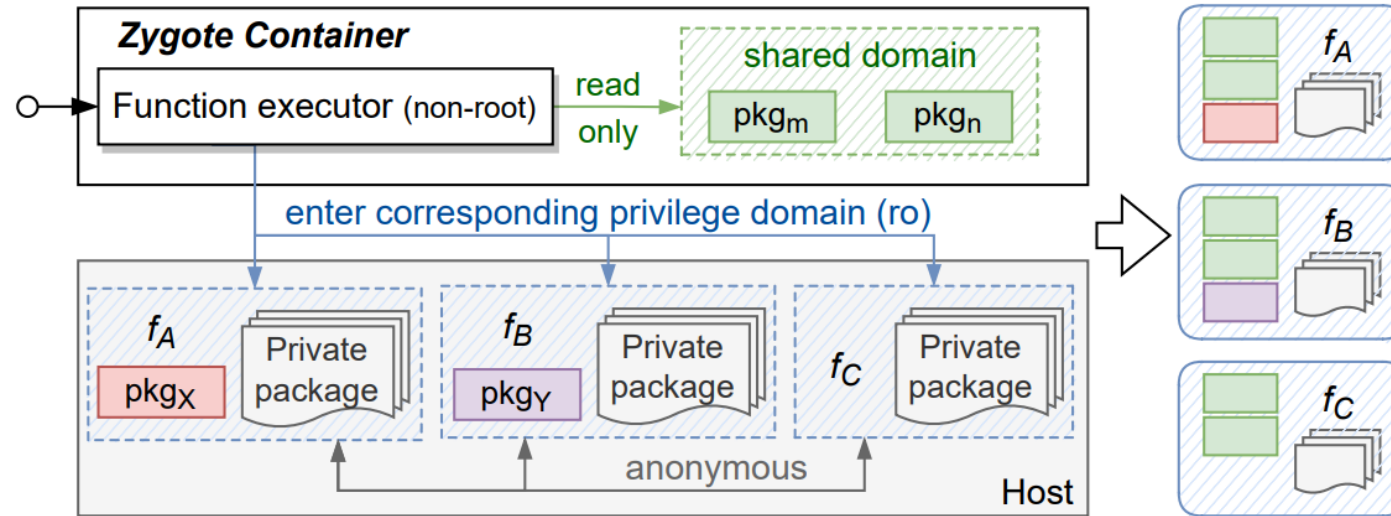
Help rather than recycle – idle containers



Feasibility of reusing idle containers

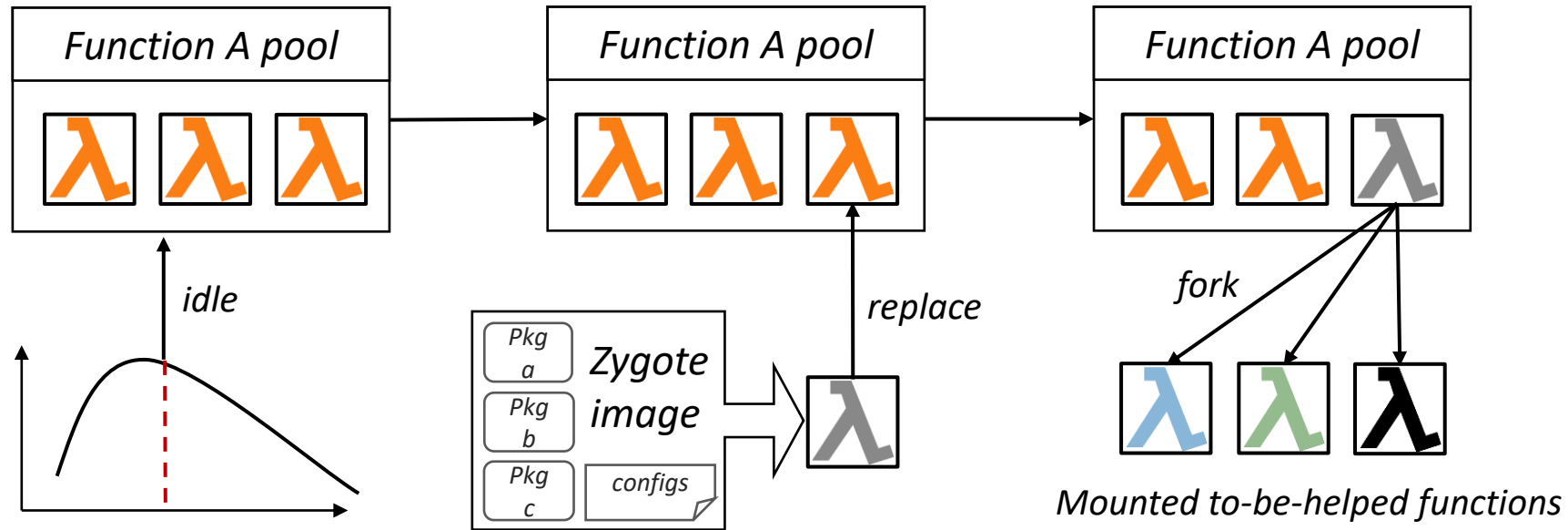
- *Serverless platforms use **keep-alive strategy** to reduce cold startups*
- ***Diurnal pattern** widely exist in many applications*
- *Containers become idle and recycled 15min later*

Help rather than recycle – Zygote containers



- The zygote container serve as a **safe checkpoint** that any function is not invoked
- Set **shared domain** and **privilege domain**
- Other to-be-helped functions are **mounted anonymously**
- Executor invoke functions with **non-root users**

Help rather than recycle –scheduling and forking Zygotes



- *Identifying idle containers for each function*
- *Build Zygote image, and replace an idle container with a Zygote*
- *Fork a Zygote to be a helper container for cold startup functions if it mounted*
- *Unmount and helper container join in corresponding container pool*

How to arrange zygote containers for appropriate forking?

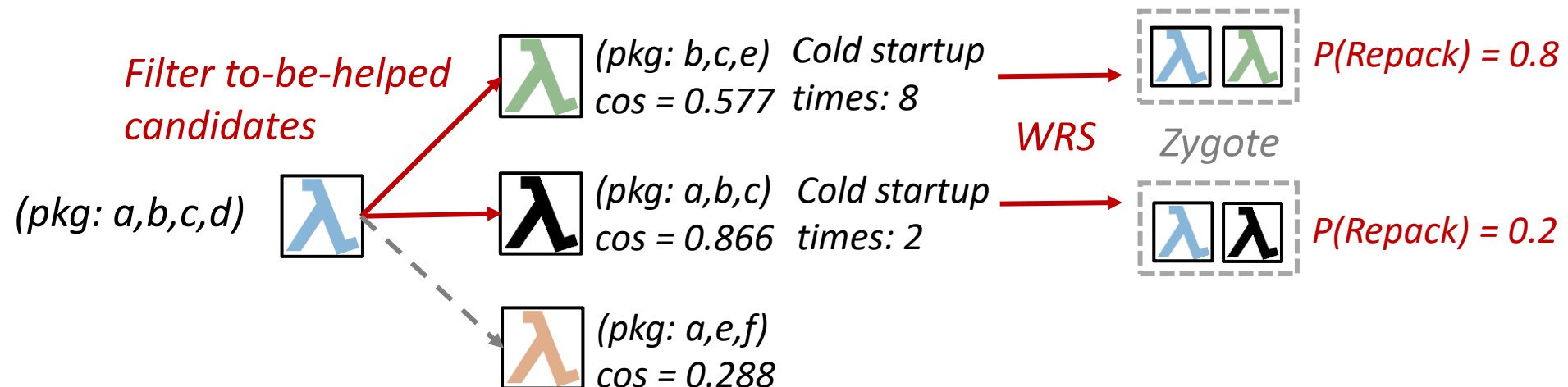
— SF-WRS (Similarity Filtered Weighted Random Sampling)

- *Select to-be-helped functions:*

based on the similarity of functions' packages (cosine)

set similarity as 0 if conflict exist

WRS makes to-be-helped functions more likely to be repacked if it has more cold startups





Introduction & Background

Motivation

Methodology & Design

Evaluation



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Evaluation



Evaluation setups:

- Baselines:

OpenWhisk with AWS application samples and Azure trace day07.

- Software and hardware setup:

	Configuration
Node	CPU: Intel Xeon(Ice Lake) Platinum 8369B @3.5GHz Cores: 8, DRAM: 16GB, Disk: 100GB SSD (3000 IOPS)
Software	Operating system: Linux with kernel 4.15.7, Docker: 20.10.6 Nginx version: nginx/1.10.3, Database: Couchdb:3.1.1 runc version: 1.0.0-rc93, containerd version: 1.4.4
Container	Container runtime: Python-3.7.0, Linux with kernel 4.15.7 Resource limit and Lifetime: 1-core with 256MB, 600s Function container limit: 10 for each function on each node prewarm pool size in OpenWhisk: 2 on each node
Benchmarks (38 functions in 10 AWS Lambda best practice applications)	serverless-ecommerce-platform (eco), etl-orchestrator (etl) cost-explorer-report (rep), serverless-tokenization (tok) transcribe-comprehend-podcast (pod), serverless-chatbot (bot) serverless-shopping-cart (cart), refarch-fileprocessing (file) finding-missing-persons-using-rekognition (rek), ddns

Evaluation



Key improvements in Azure trace:

84.6%+

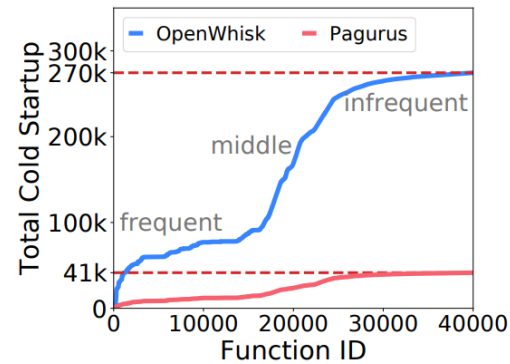
Alleviate most functions' cold startups, 73.4% of functions no longer need cold startups

20ms-

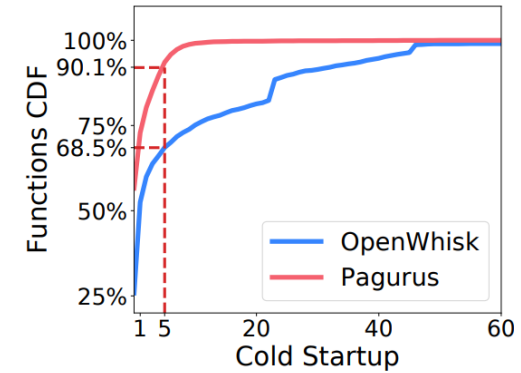
Reduce cold startup response latency to 16ms if it need additional packages

p95latency-

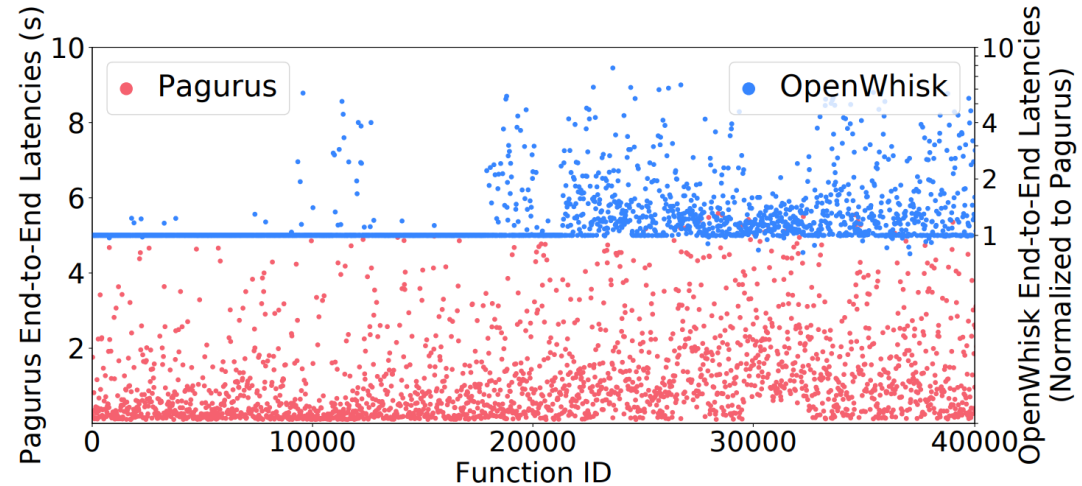
Lower 95%-ile latency, especially for mid-popular functions



(a) Cumulative cold startups



(b) Frequencies of cold startups





Introduction & Background

Motivation

Rationale & Design

Evaluation

Conclusion



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Conclusion



Summary:

- *Resource-friendly and security-ensured Zygote design.*
 - *Shared domain and privilege domain.*
- *Replacing idle containers as Zygote containers for inter-function sharing.*
 - *Reusing others' Zygote containers to alleviate cold startups.*
- *SF-WRS based Zygote arrangement and scheduling.*
 - *Calculate cosine distance as similarity to improve sharing efficiency*

Another related track presentation:

[RunD: A Lightweight Secure Container Runtime for High-density Deployment and High-concurrency Startup in](#)

[Serverless Computing](#) *Introduces how to enable high-density and high-concurrency startup*



Thanks!

Q&A

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